



A Spatiotemporal investigation of heat wave characteristics and trends in Los Angeles

Glynn Hulley¹, Nabin Malakar¹, Jeffrey Luvall²

¹Jet Propulsion Laboratory, California Institute of Technology

²NASA Marshall Space Flight Center

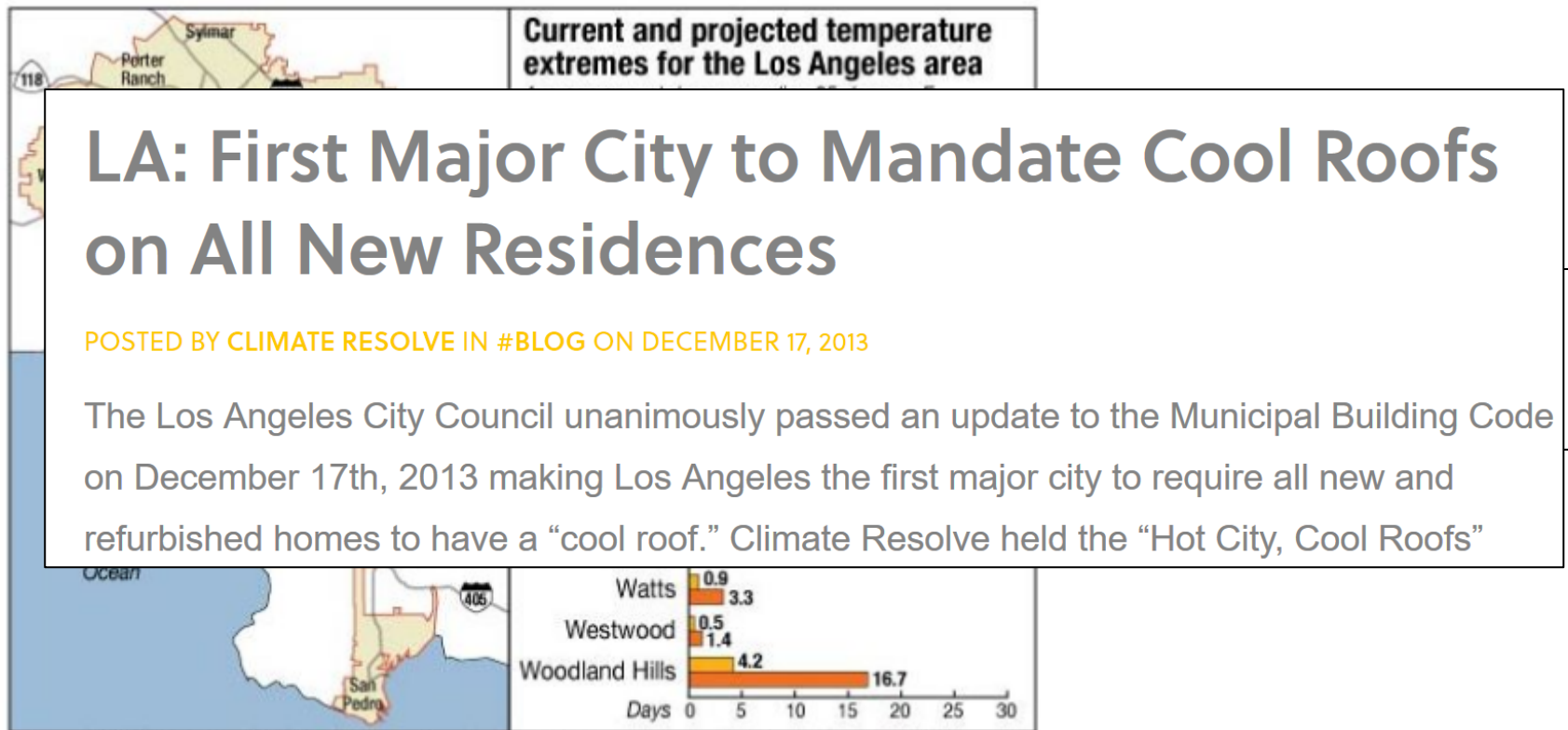
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HyspIRI Workshop, Pasadena, CA, 17-19 October 2017

Outline

- Background and Motivation
- Heat waves
 - Definition
 - Detection
 - Trends
- Thermal remote sensing
 - Spatiotemporal LST patterns
 - Extreme heat day trends
 - Heat wave vulnerability maps

Mercury rising: Greater L.A. to heat up an average 4 to 5 degrees by mid-century

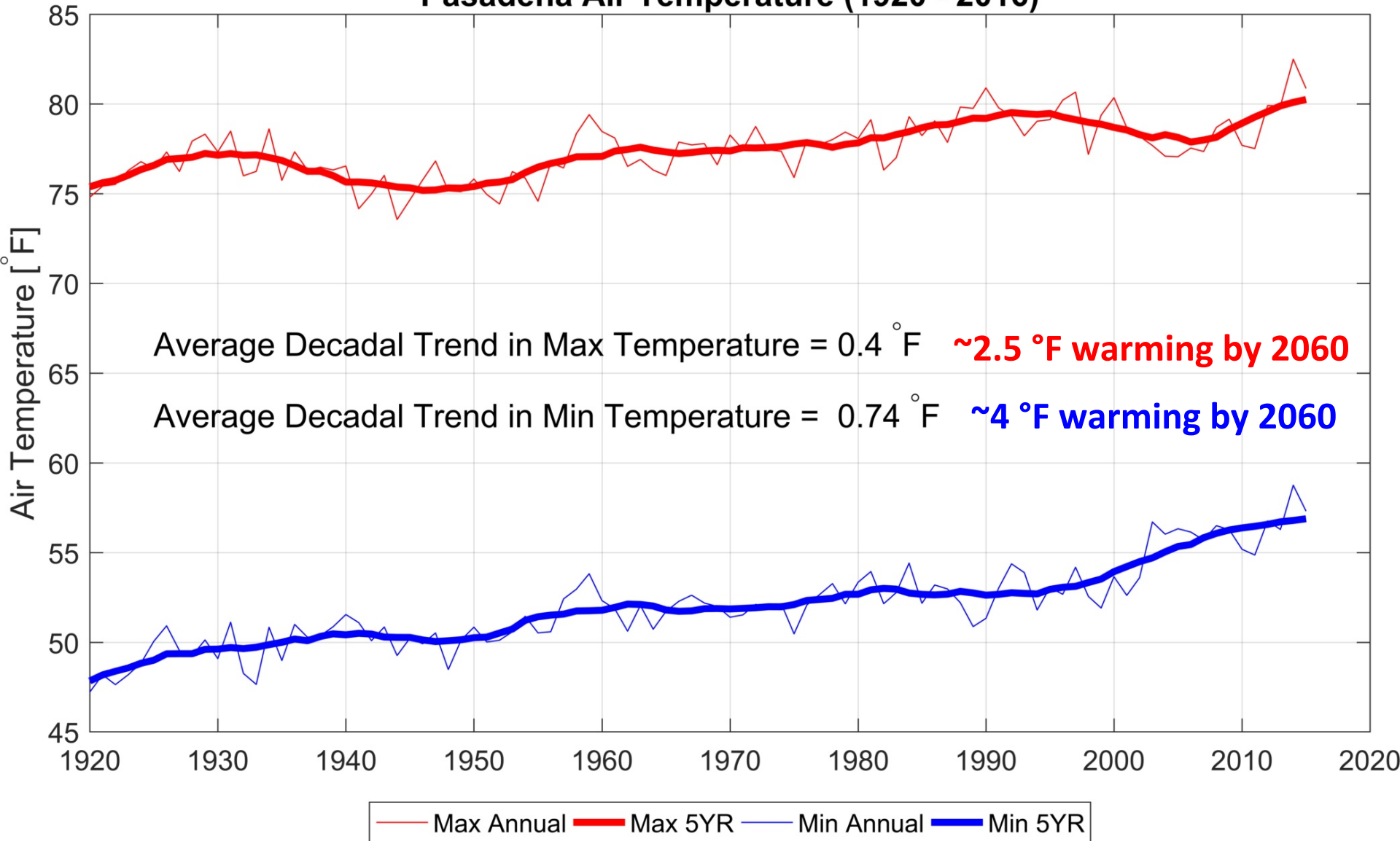


Source: UCLA LARC study, 2012; chart based on the mean/average projected by the 19 climate models

Before and after: Current and projected temperature extremes in the L.A. area.

UCLA LARC Study (Hall et al. 2012) – ensemble climate model projection

Pasadena Air Temperature (1920 - 2016)



..On a global scale

NATURE CLIMATE CHANGE | LETTER



Global risk of deadly heat

Camilo Mora, Bénédicte Dousset, Iain R. Caldwell, Farrah E. Powell, Rollan C. Geronimo, Coral R. Bielecki, Chelsie W. W. Counsell, Bonnie S. Dietrich, Emily T. Johnston, Leo V. Louis, Matthew P. Lucas, Marie M. McKenzie, Alessandra G. Shea, Han Tseng, Thomas W. Giambelluca, Lisa R. Leon, Ed Hawkins & Clay Trauernicht

Nature Climate Change 7, 501–506 (2017) | doi:10.1038/nclimate3322

Currently, about 30% of the world's population experiences at least 20 days per year of potentially deadly heat.

By 2100, this percentage jumps to 74% of the population if emissions continue unchecked.

Heat Waves

Most common cause of weather-related deaths in the United States!

They cause more deaths each year (~1,500) than hurricanes, lightning, tornadoes, floods, and earthquakes combined (~200).

The number of heat-related deaths is rising.

1995: 465 deaths in Chicago.

2003: 15,000 deaths in Paris

2010: 10,000 deaths in Russia

2013: 760 deaths in UK

CDC Home
CDC Centers for Disease Control and Prevention
CDC 24/7: Saving Lives. Protecting People.™

Tracking A-Z Index [A](#) [B](#) [C](#) [D](#) [E](#) [F](#) [G](#) [H](#) [I](#) [J](#) [K](#) [L](#) [M](#) [N](#) [O](#) [P](#) [Q](#) [R](#) [S](#) [T](#) [U](#) [V](#) [W](#) [X](#) [Y](#) [Z](#) #

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- [Extreme Heat](#)

Extreme Heat

The Tracking Network collects data on heat-related deaths and illnesses throughout the United States and provides information so people can protect themselves.

Heat-related Deaths




Heat events, or heat waves, are the most common cause of weather-related deaths in the United States. They cause more deaths each year than hurricanes, lightning, tornadoes, floods, and earthquakes combined.

The number of heat-related deaths is rising. For example, in 1995, 465 heat-related deaths occurred in Chicago. From 1999 to 2010, a total of 7,415 people died of heat-related deaths, an average of about 618 deaths a year.

Heat Stress

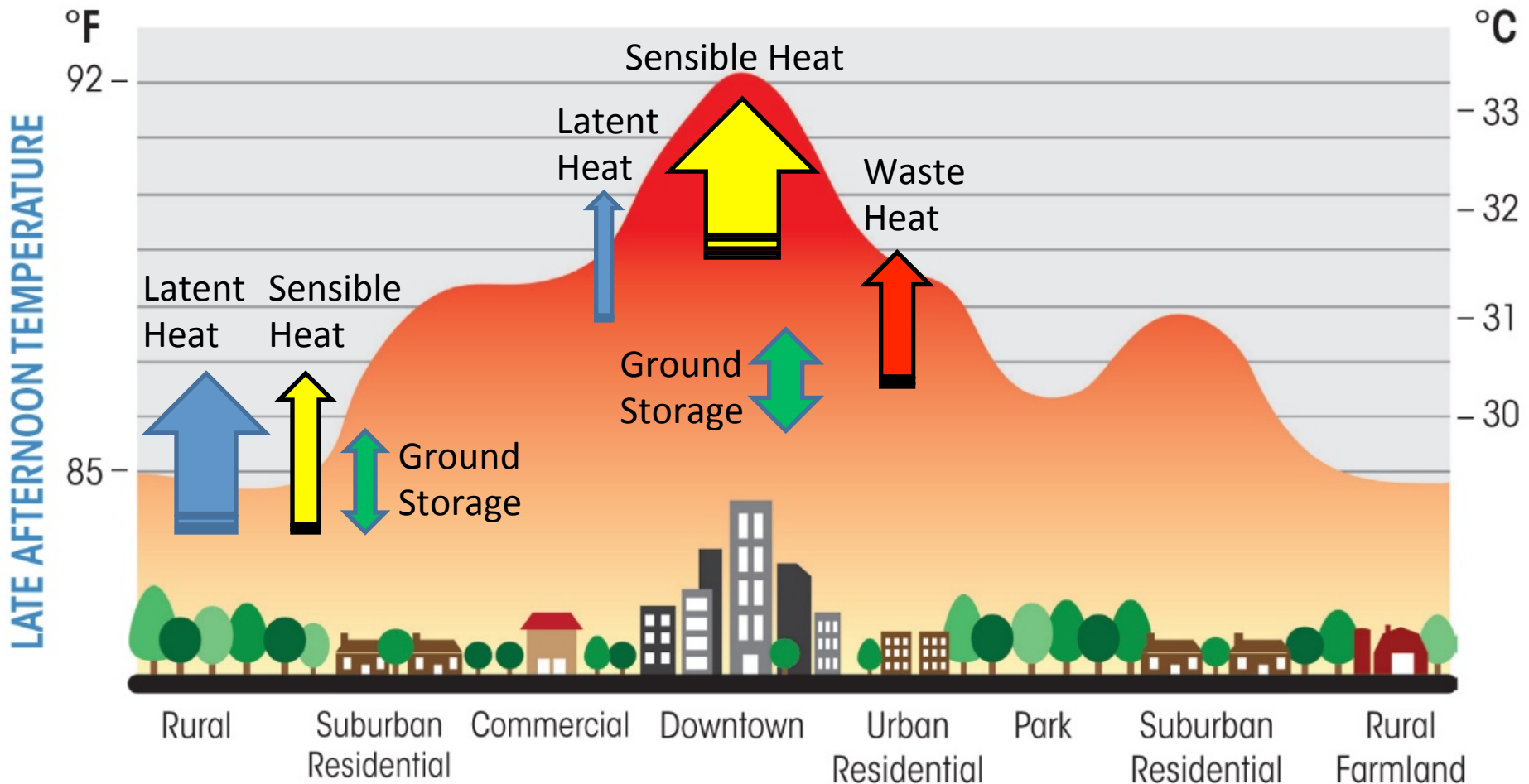
Heat stress is heat-related illness caused by your body's inability to cool down properly. The body normally cools itself by sweating. But under some conditions, sweating just isn't enough. In such cases, a person's body temperature rises rapidly. Very high body temperatures may damage the brain or other vital organs.

Several factors affect the body's ability to cool itself during extremely hot weather. When the humidity is high, sweat will not evaporate as quickly, preventing the body from releasing heat quickly. Other conditions related to

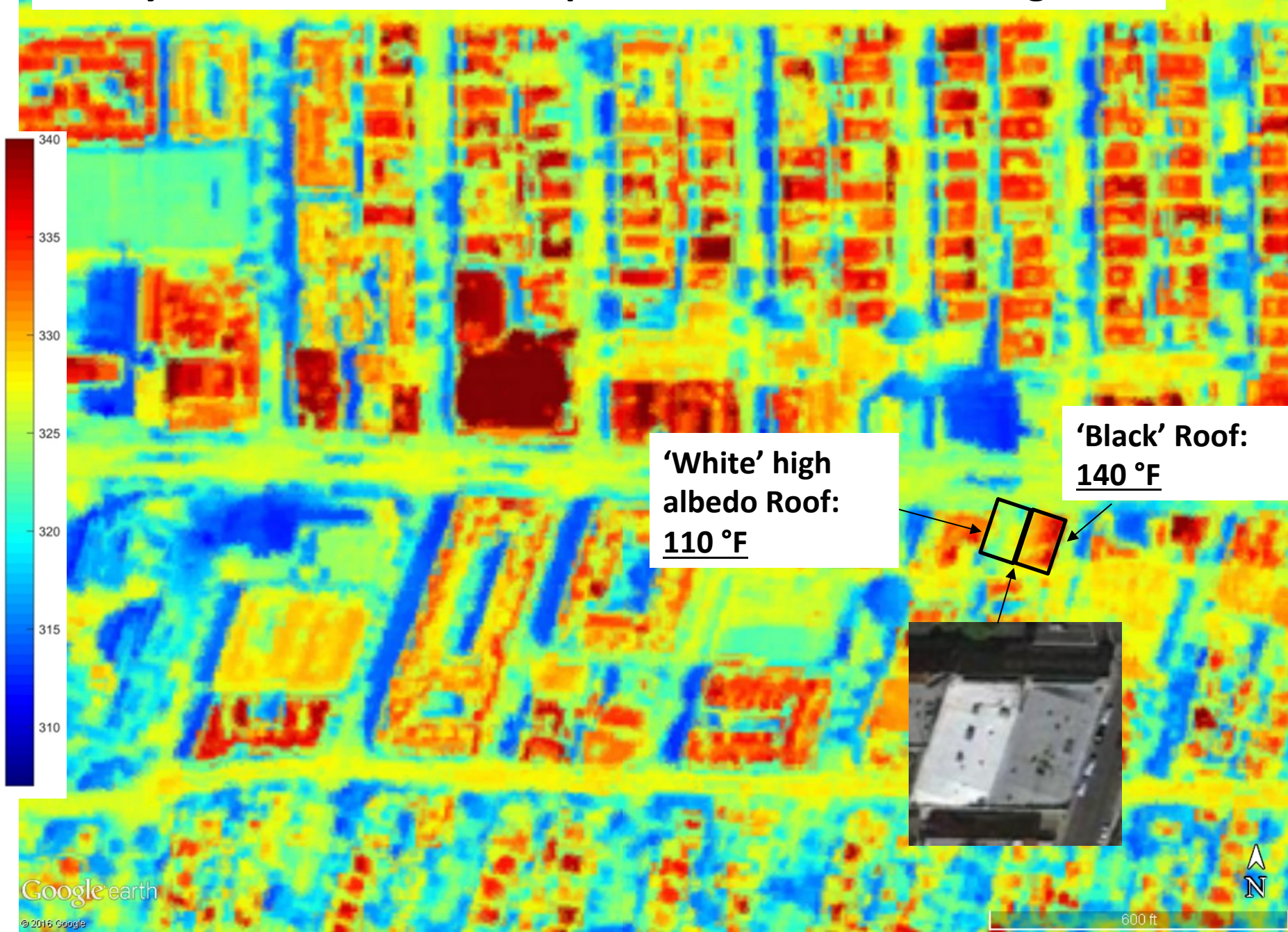


Urban Heat Island (UHI) Effect

Energy absorbed by man-made materials during day is released slowly at night resulting in heating of air



2m HyTES Land Surface Temperature, La Brea, Los Angeles



Heat wave definition

- *Excess Heat Index (EHI)*
 - Unusually high heat arising from daytime temperatures that is not discharged overnight due to combined overnight high temperature

$$EHI = T_i - T_{97.5}$$

$$\text{Where, } T_i = (T_{max} + T_{min})/2$$

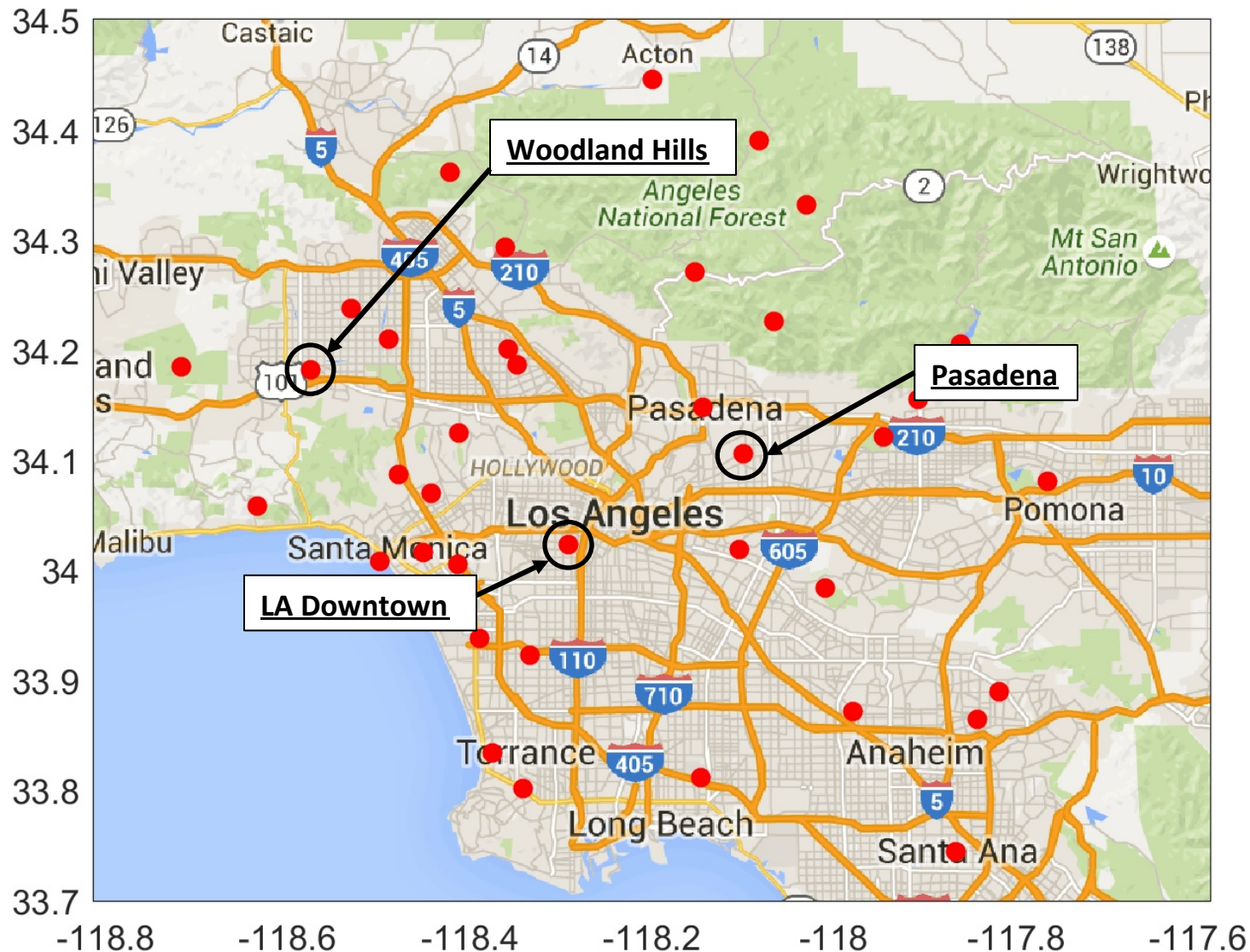
$$T_{97.5} = 98^{th} \text{ percentile of daily } T_i \text{ climatology}$$

$$T_i = \text{apparent temperature} = -2.7 + 1.04 * T + 2.0 * RH - 0.65 * V_s$$

Temperature equivalent as 'felt' by humans

Heat wave = 3 or more consecutive days where EHI values exceed a threshold

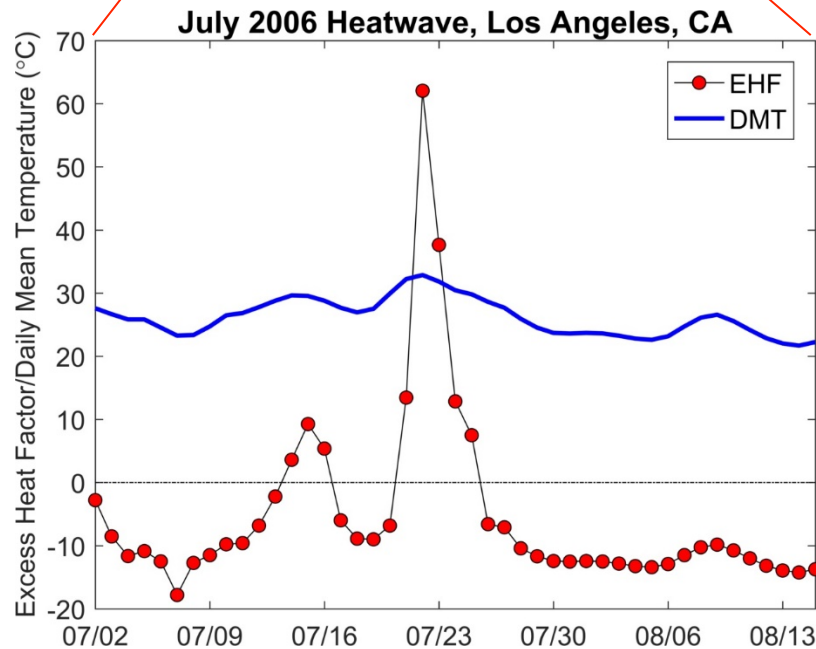
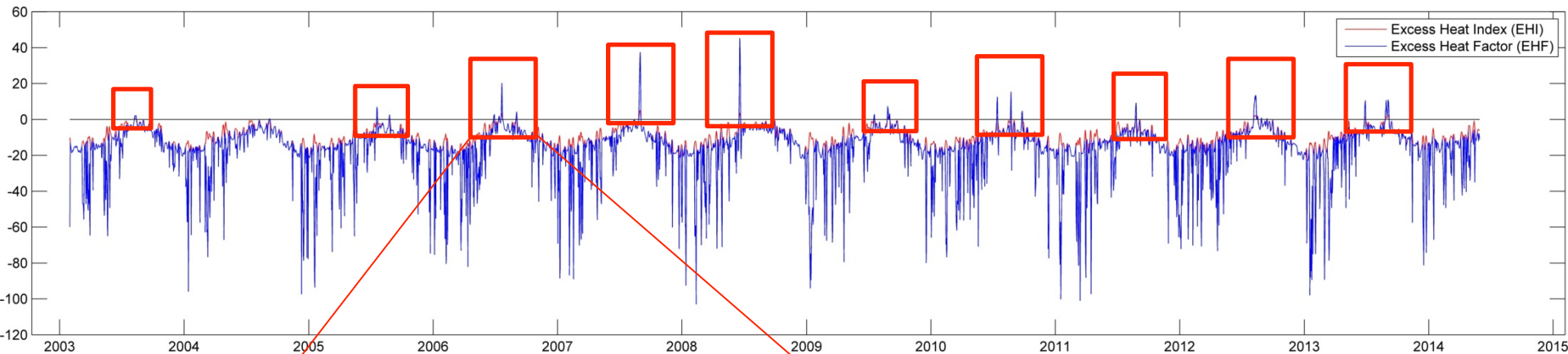
Heat wave trend statistics using NOAA COOP air temperature data (1920 – 2017)



Heat Wave Detection

NCDC 2m Air Temperature – Downtown LA

heatwave: 3 or more consecutive days where EHI values exceed a certain threshold (0, or 20 for extreme)



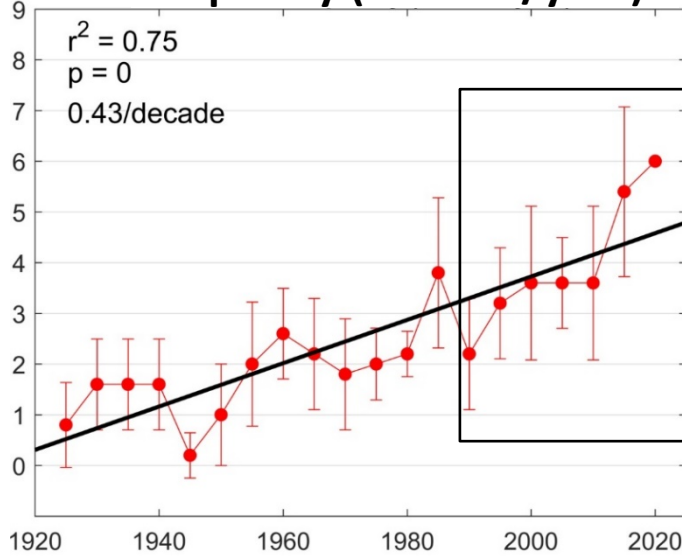
LA July 2006 Heat wave:

- Valley temperatures peaked at 119 °F (all time record)
- Combination of high heat/humidity
- 30 deaths across CA state

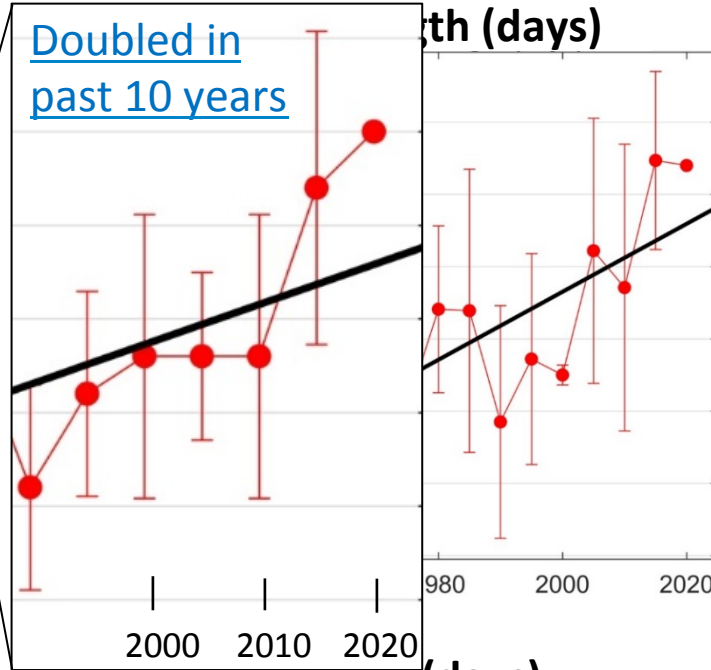
Heat Wave Trends

(Each point represents 5-year average)

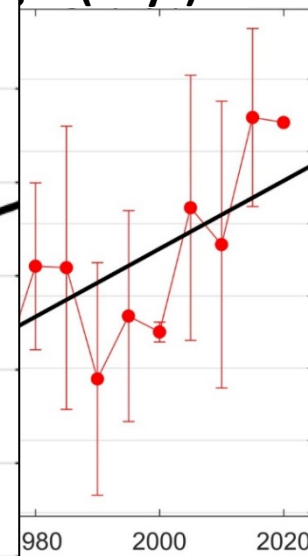
Frequency (number/year)



Doubled in
past 10 years

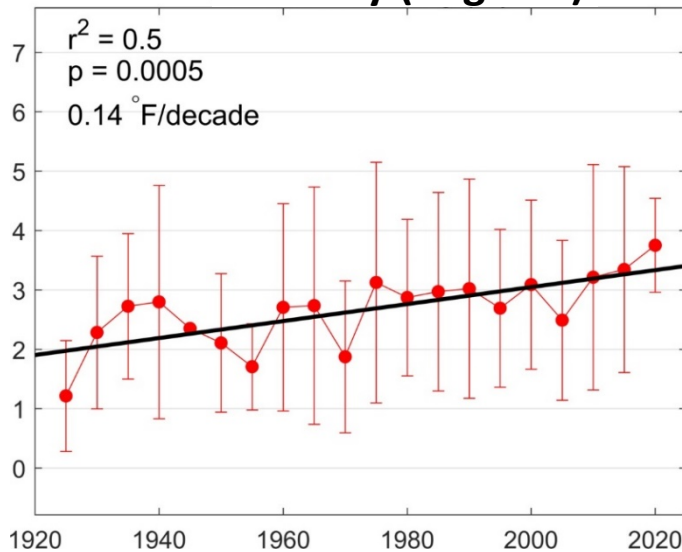


Length (days)

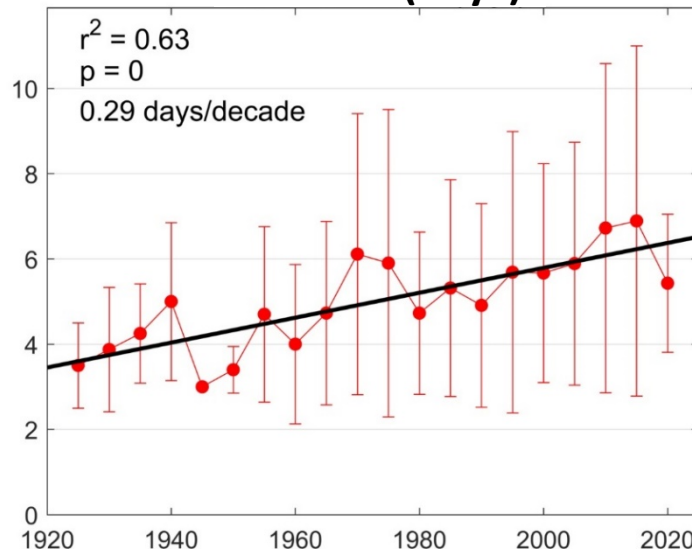


Increases Fire
risk!

Intensity (degrees)



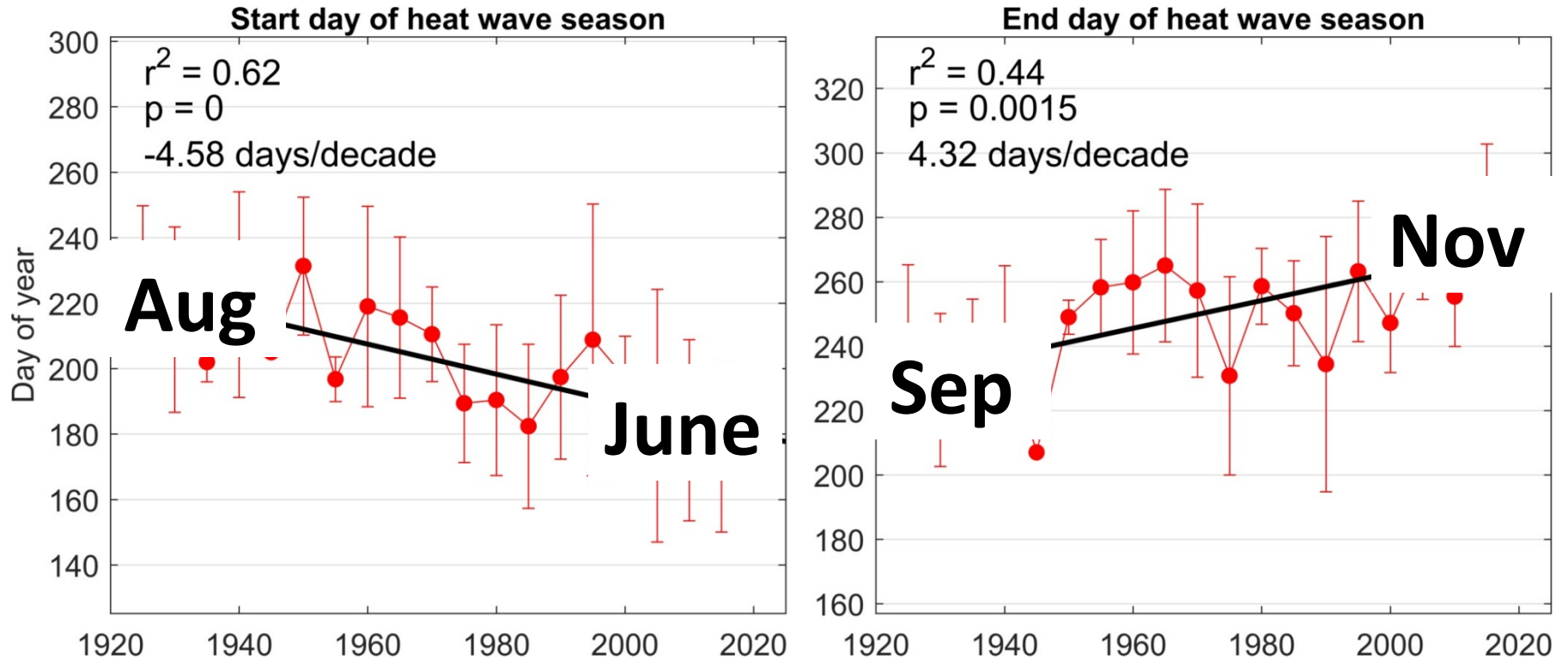
Duration (days)



Human health/
comfort impacts

Pasadena heat wave seasonality

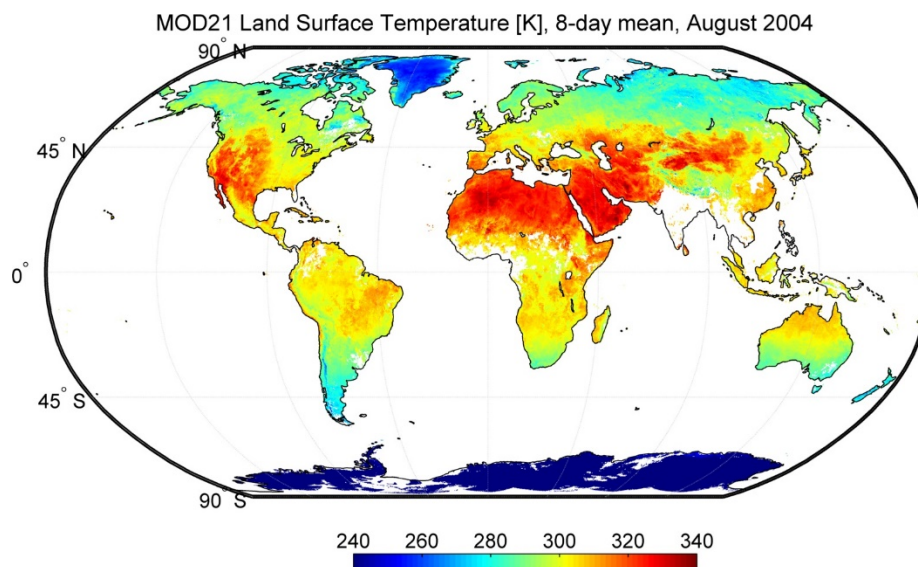
Heat waves are starting earlier in the year and ending later = increased fire risk



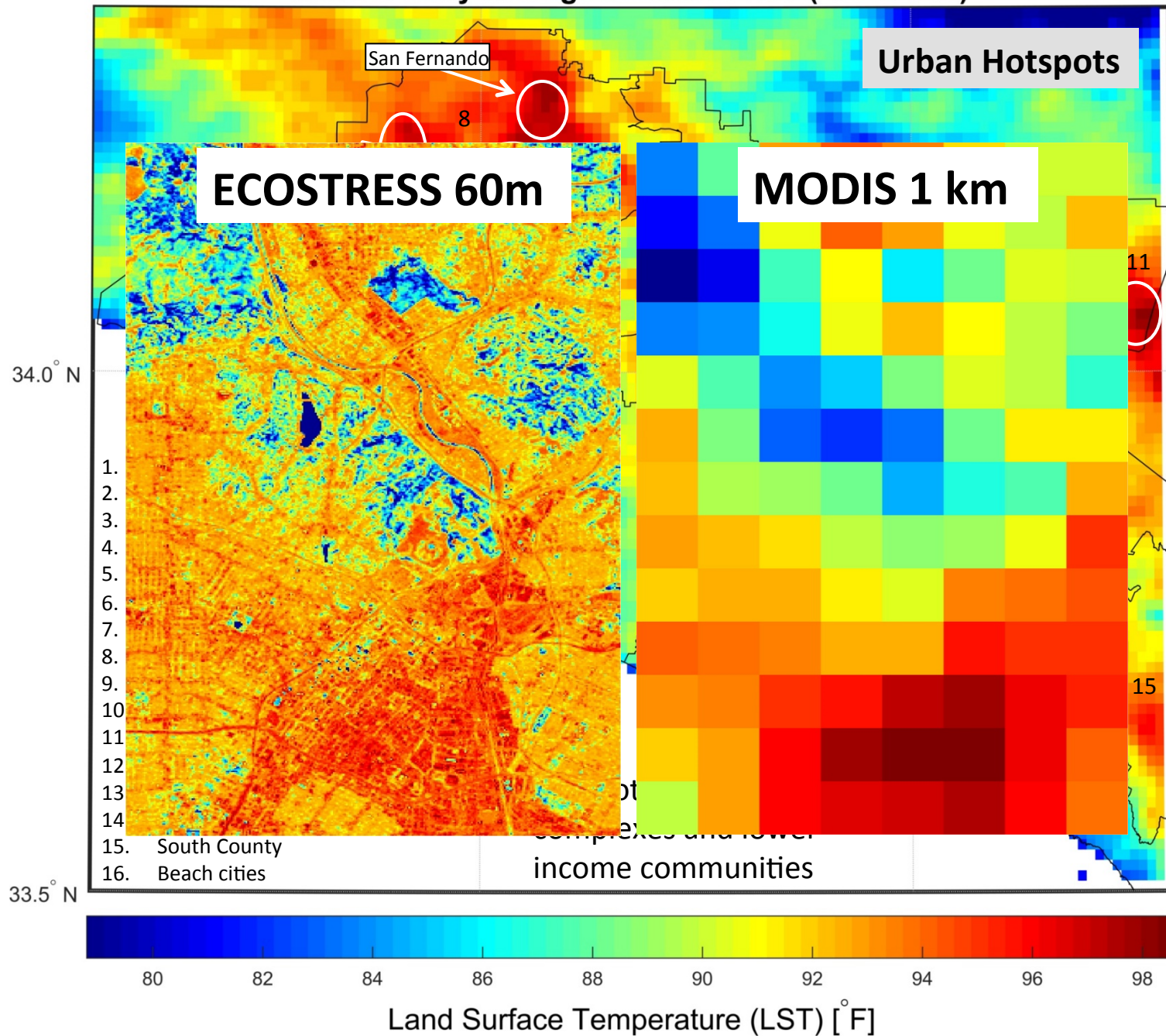
New MODIS LST Product (JPL) – Collection 6

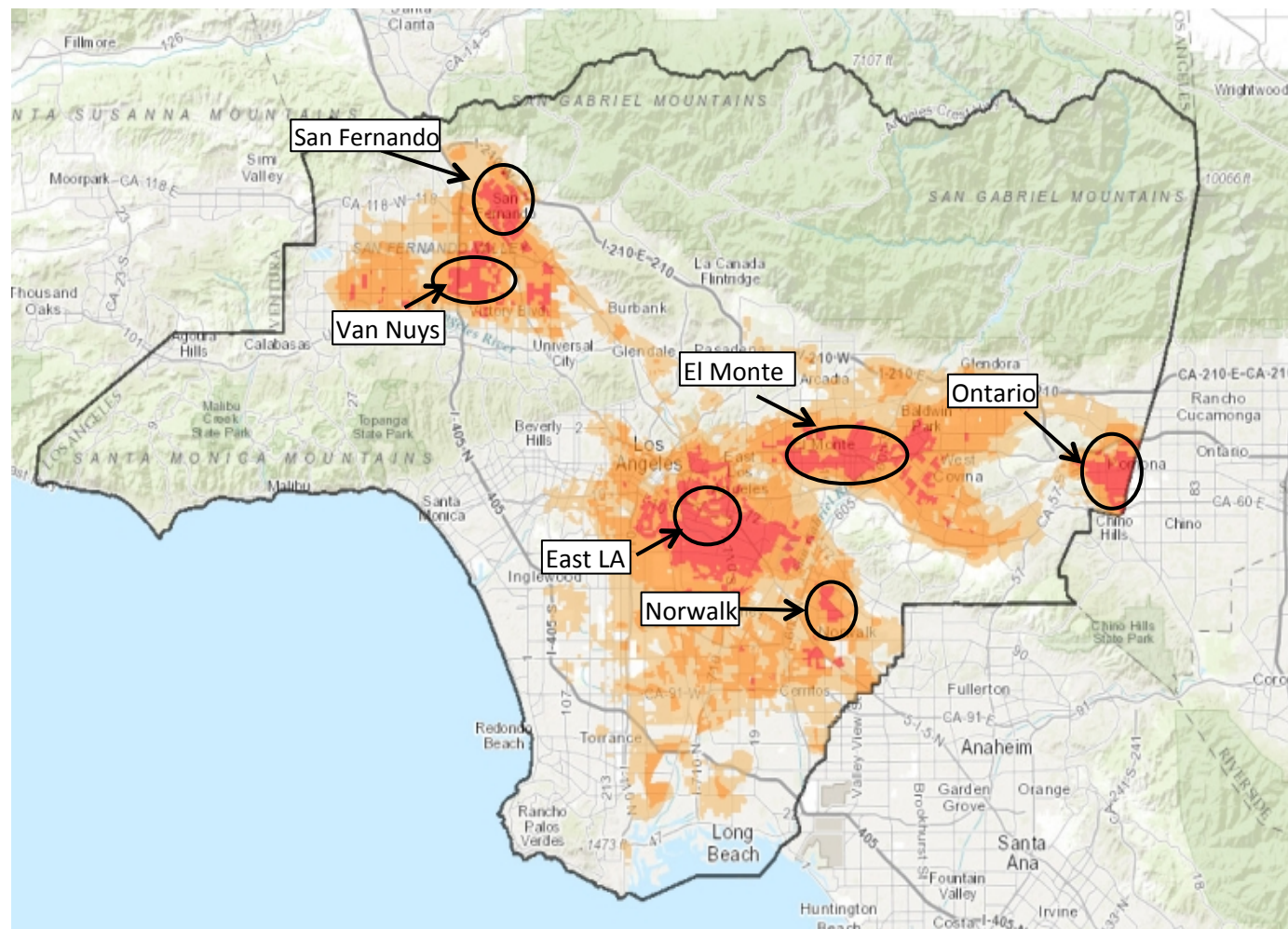
New Products	PI	Status	Spatial	Formats	Algorithm	SDS
MOD21	Hulley (JPL)	Released with Tier-2 Collection 6 (Fall 2017)	1-km	L2 Swath, L2 8 day 2X Daily	Temperature Emissivity Separation (TES)	- LST - Emissivity bands 29, 31, 32

LST and Emissivity physically retrieved (ECOSTRESS, HypsIRI, MASTER)



MOD21 Daily average heatwave LST (2003-2016)





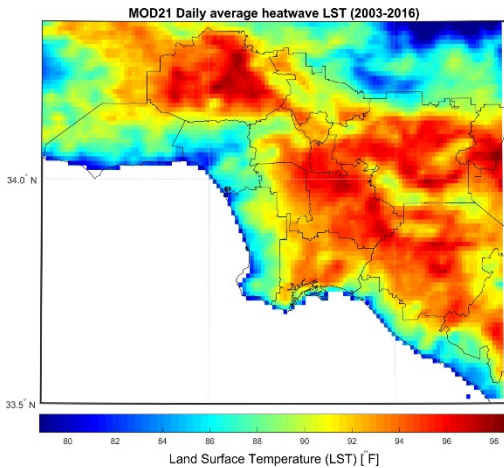
Heat Vulnerability map based on demographic information (income, education, age), identifies communities most vulnerable to rising temperatures.

Good correlation with LST data from MODIS. But some areas missed!

Source: Climate Smart Cities program, Fernando Cazares.

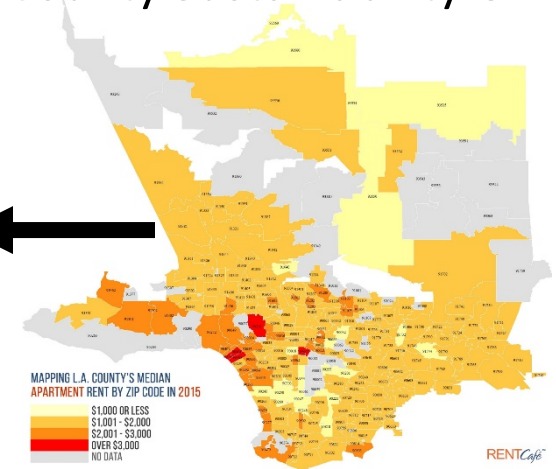
LST Data

(MODIS, ECOSTRESS, HypsIRI)



Demographic Data

(LA County Sustainability Office)

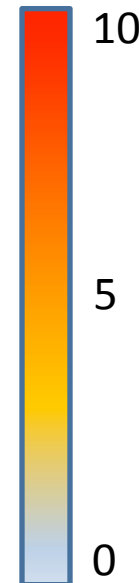


Human-Comfort
Model (COMFA)
Brown et al. 1995

Urban Heat Stress Index (UHSI)



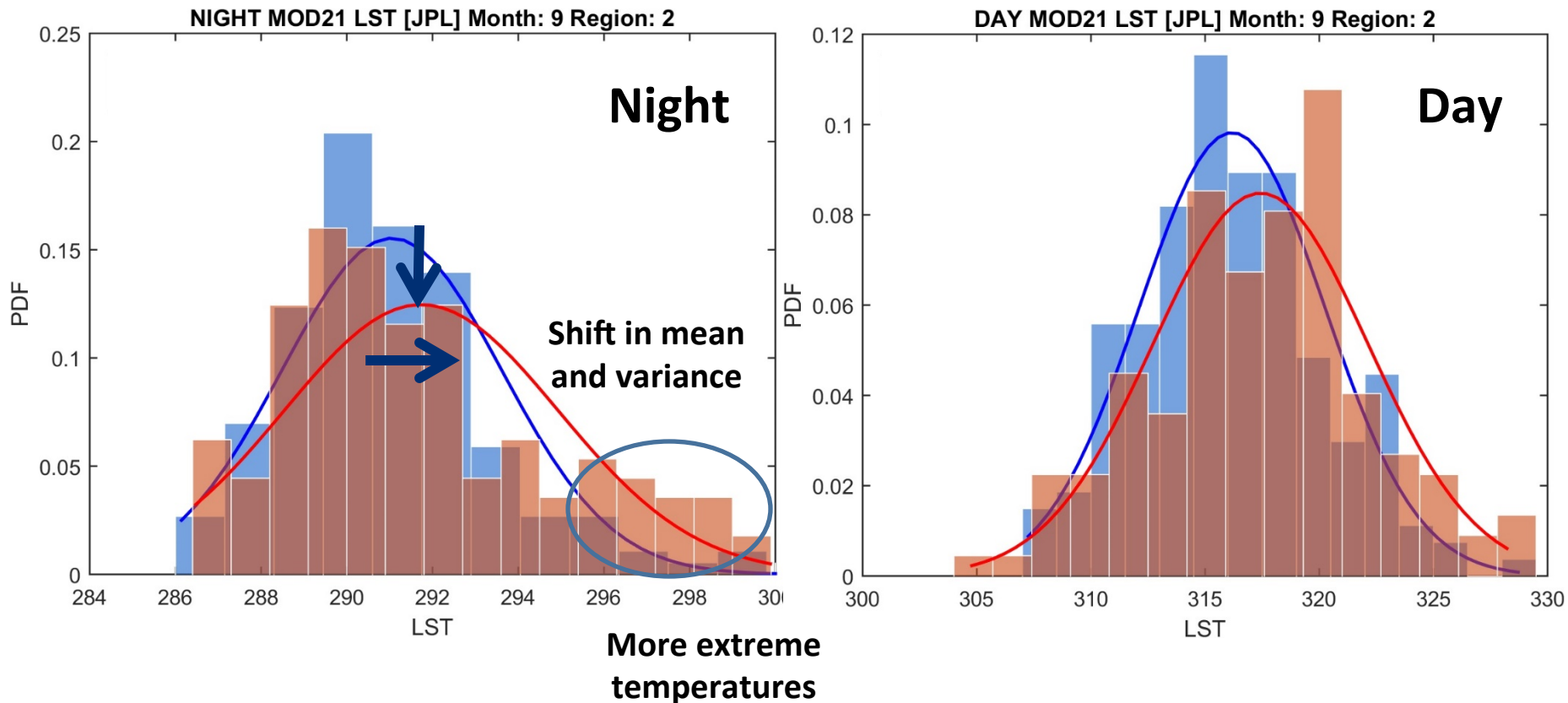
- Near real-time
- Communicated to local officials
- Heat warnings
- Used in mitigation efforts
- Extend to other major cities



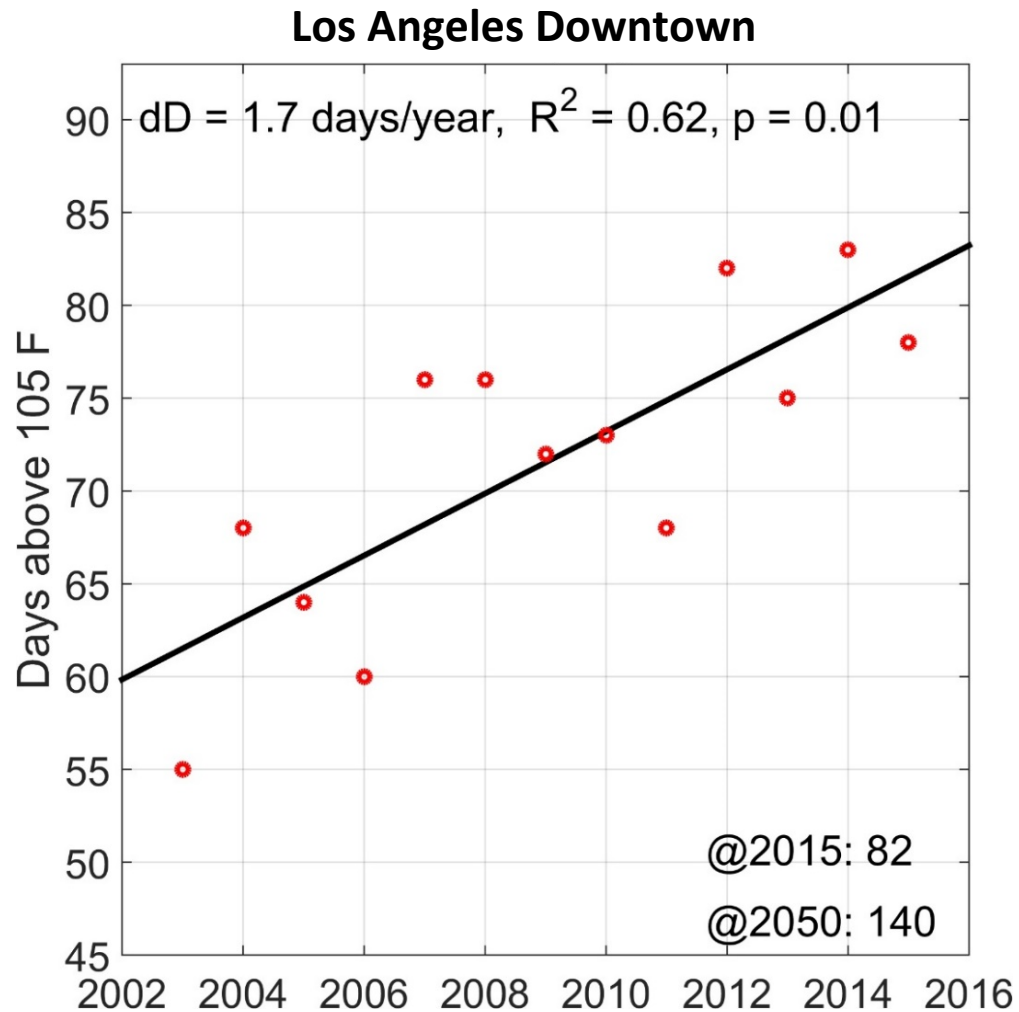
MOD21 day/night LST PDF

2003-2009
2009-2016

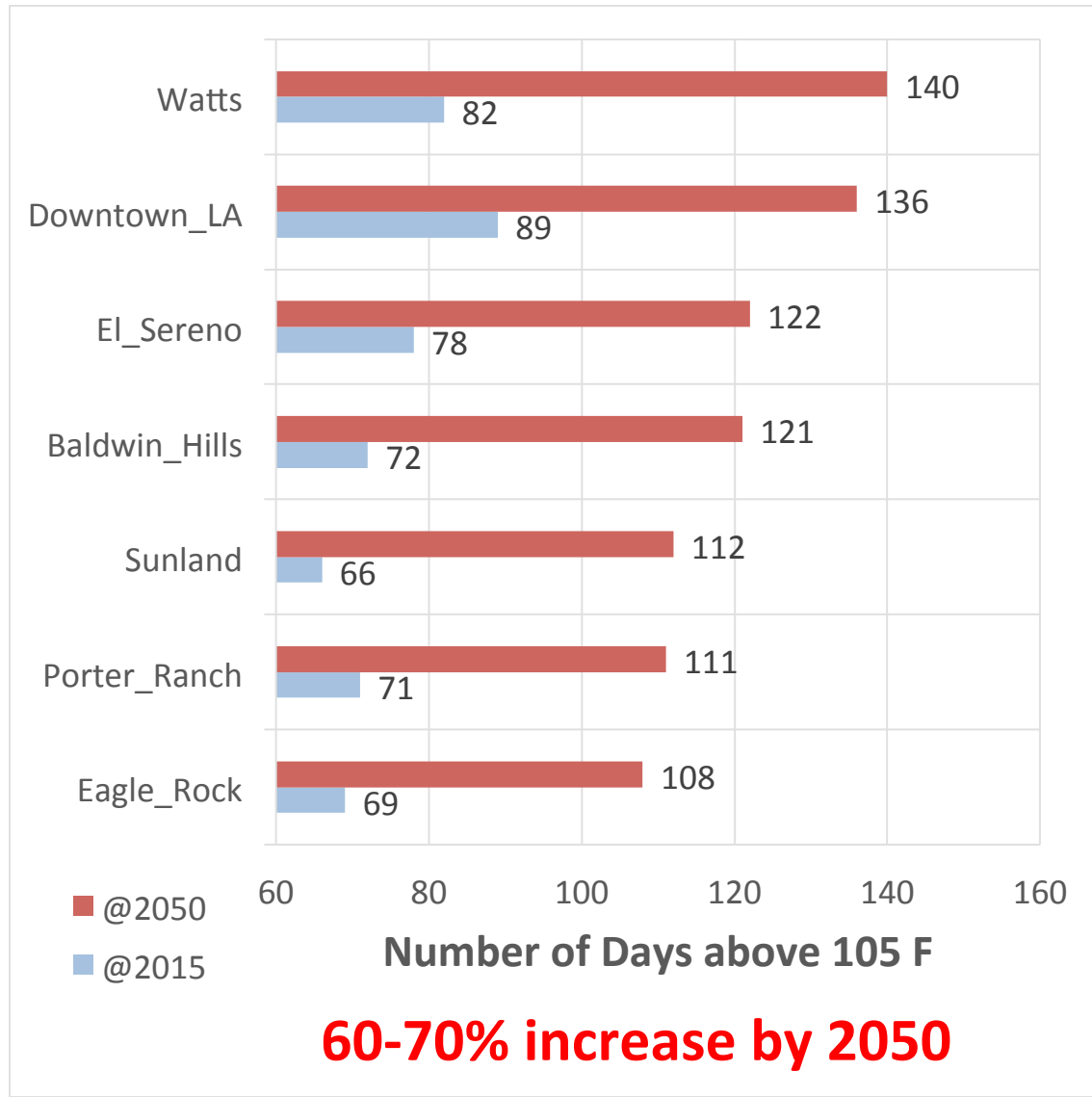
East LA, September



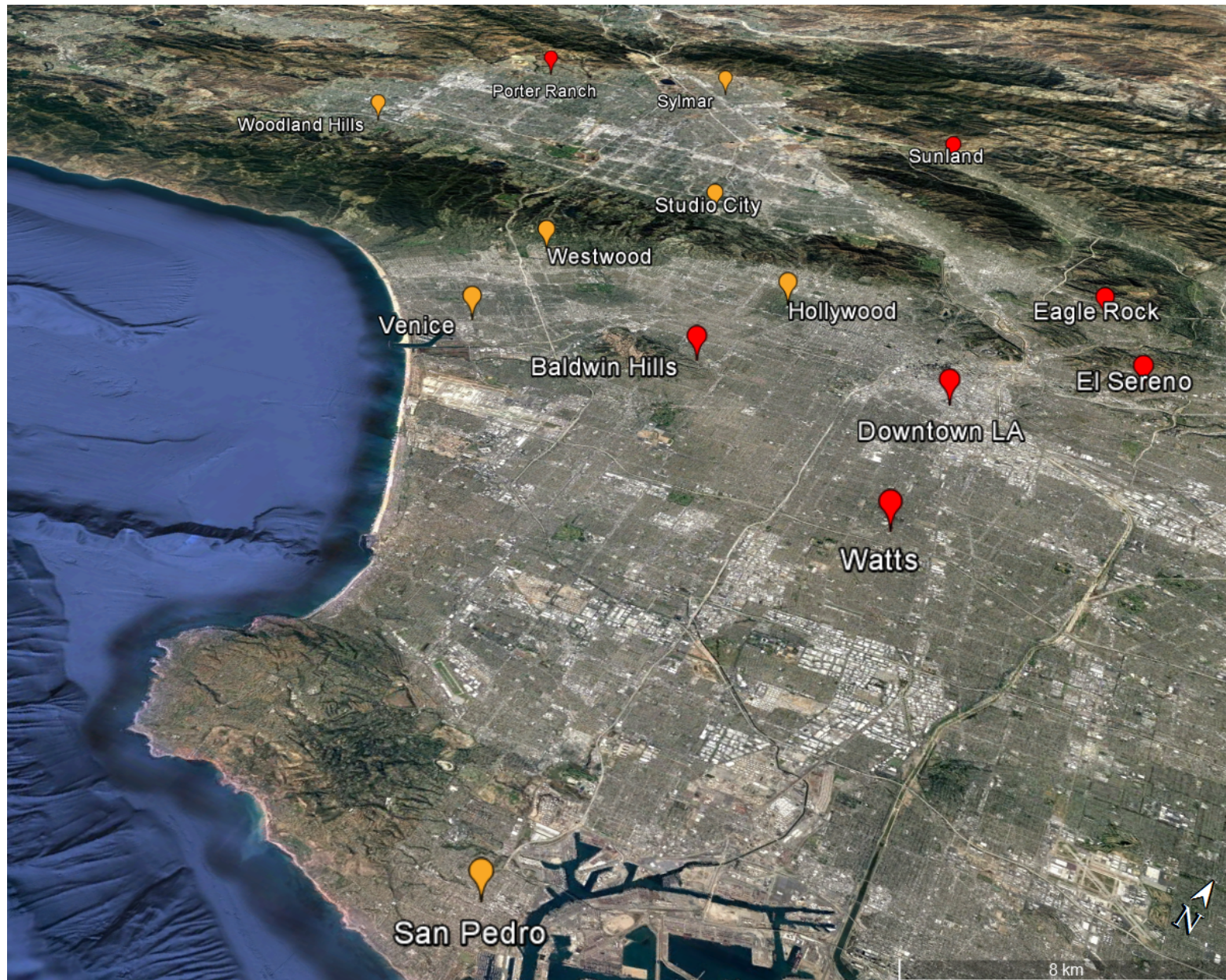
Days with MODIS LST > 105 °F



Areas with significant trends (2003-2017)



More extreme temperatures expected inland





LARC
Los Angeles Regional Collaborative
for Climate Action and Sustainability

WE'RE TAKING ACTION
TO ENSURE A CLIMATE-RESILIENT LOS ANGELES

Join us.

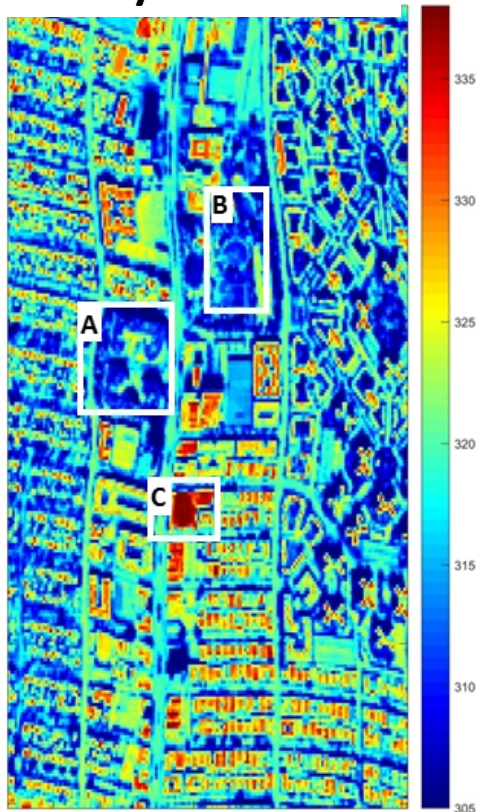


Urban Thermal Sharpening

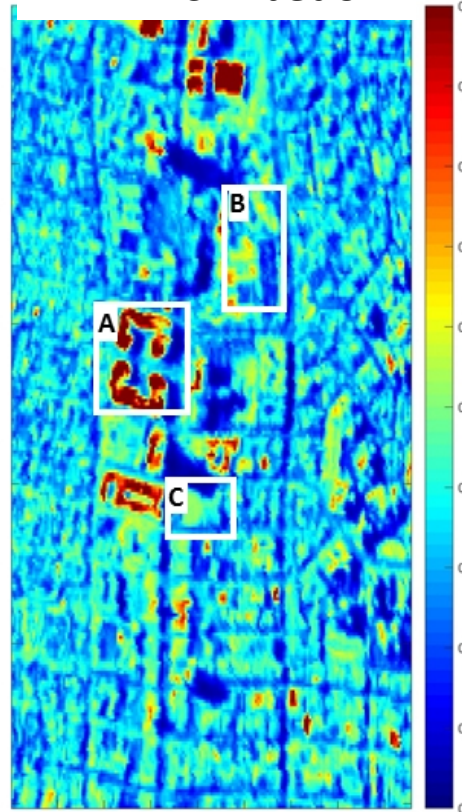
- Imaging spectroscopy in VSWIR (0.4-2.5 μm) can be acquired at higher spatial resolution than TIR (8-12 μm)
- TIR wavelengths are longer – larger optics, cooling challenges

Resolution	SWIR	TIR
MODIS	250-500m	1 km
Landsat	30 m	100 m
HyspIRI	30 m	60 m

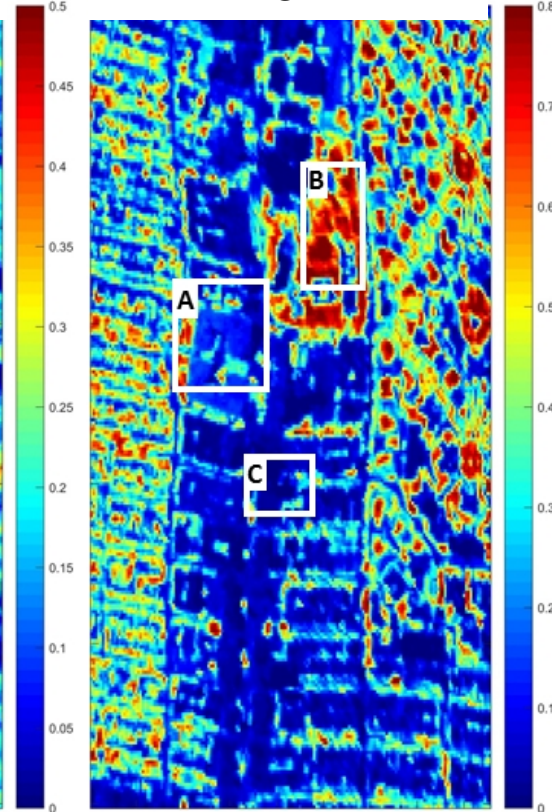
HyTES LST



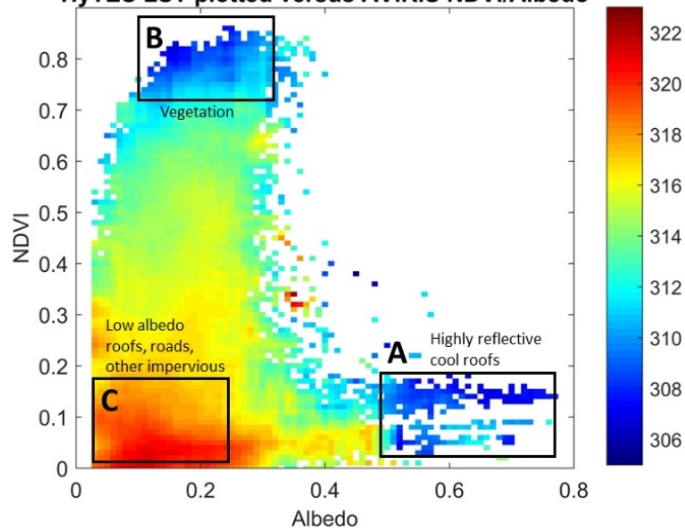
AVIRIS Albedo



AVIRIS NDVI



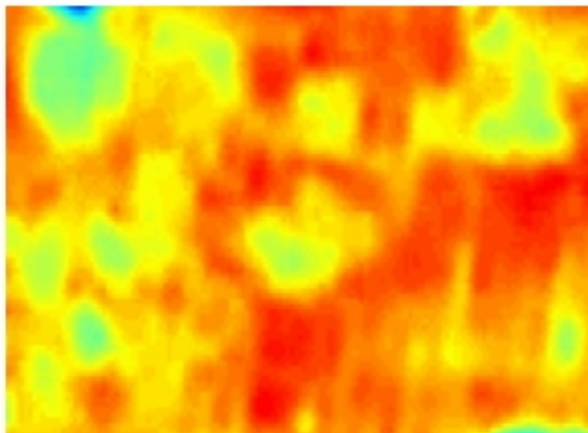
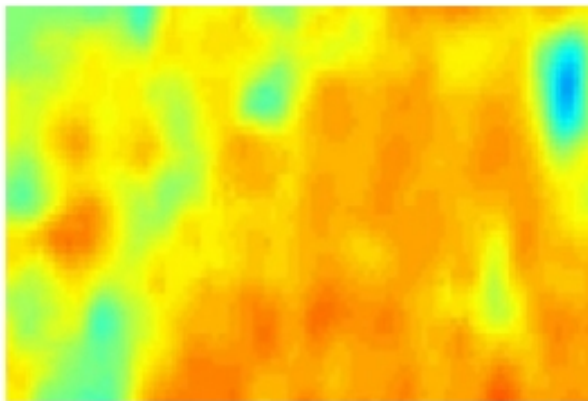
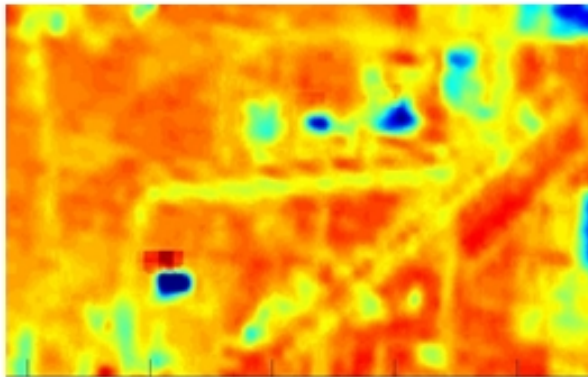
HyTES LST plotted versus AVIRIS NDVI/Albedo



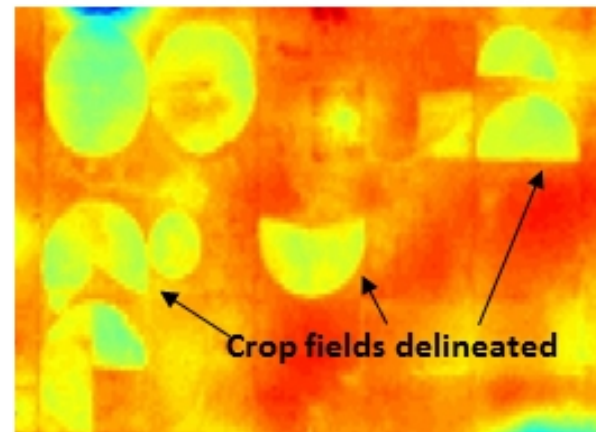
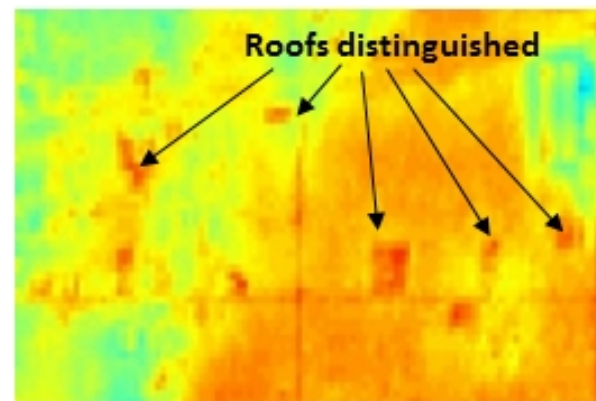
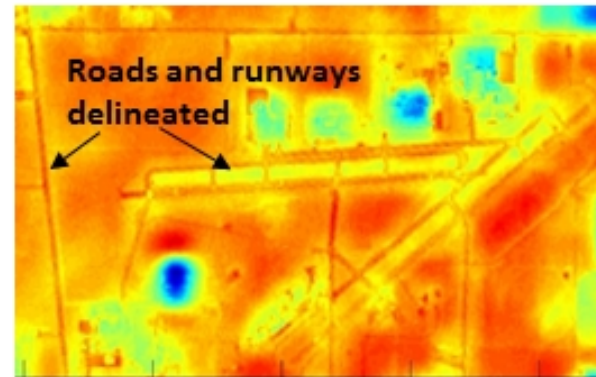
HUTS (High Resolution Urban Thermal Sharpener) *Dominguez et al. 2011*

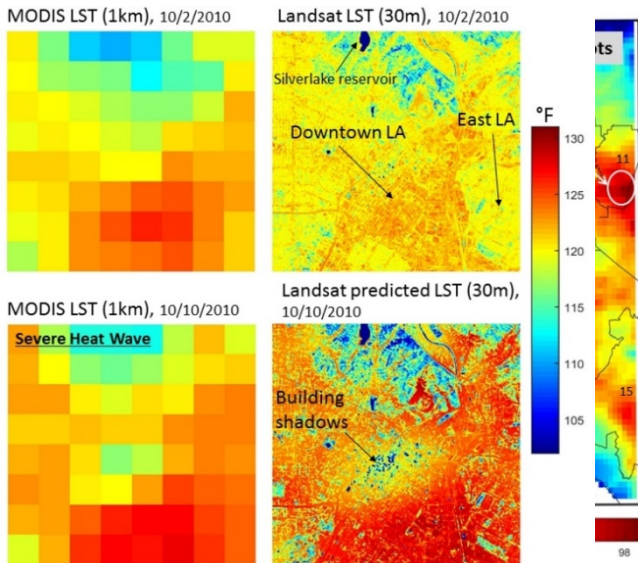
$$LST = f(\text{Albedo}, \text{NDVI}) + \text{dLST}$$

Landsat 100 m LST

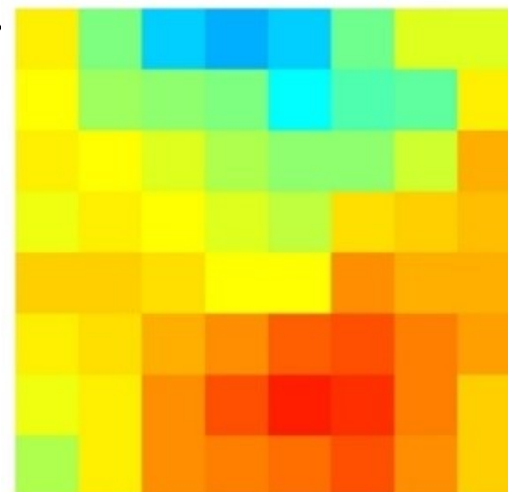


Landsat 30 m LST





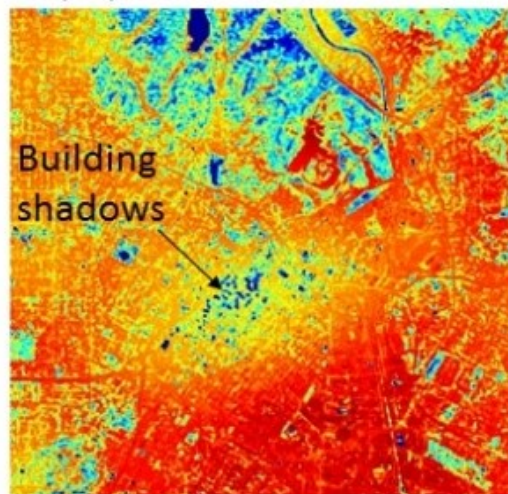
MODIS LST (1km), 10/2/2010



Landsat LST (30m), 10/2/2010



Landsat predicted LST (30m), 10/10/2010



MODIS LST (1km), 10/10/2010

